Lee-Yang edge singularities on the Lattice : Study of singularities in QCD 2+1(f $\ell$ ) in the complex  $\mu_B$  plane using Padé approximants

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Based on work with Bielefeld-Parma collaboration : in preparation P. Dimopoulos, F. Di Renzo, J. Goswami, G. Nicotra, C. Schmidt, S. Singh, K. Zambello, F. Ziesché

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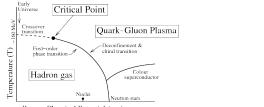
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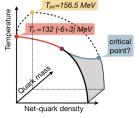
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# The Goal : Singularities in the QCD phase diagram

- The QCD phase diagram remains one of the more important open problems in HEP. QCD being strongly interacting is best studied using non-perturbative tools.
- Lattice QCD is currently one of those tools but it only works at zero chemical potential (µ<sub>B</sub>=0).
- Standard MC simulations fail at µ<sub>B</sub> > 0 as the fermion determinant becomes complex.





Baryon Chemical Potential (µB)

Figure: conjectured QCD phase diagram <sup>1</sup>

<sup>1</sup>left : TIFR-TH-14-11 arXiv:1404.3294 and right : Bielefeld (taken from C.Schmidt)  $\Box \Rightarrow \langle \Box \Rightarrow \langle \Xi \Rightarrow \langle \Xi \Rightarrow \rangle \equiv \neg \Im$ 

Current methods to probe the QCD phase diagram on the Lattice

- ► Taylor expansion about µ<sub>B</sub>=0. Simulations get harder for computing higher cumulants. [Allton, et.al Bielefeld-Swansea (2002)]
- Analytic continuation from simulations at imaginary µ<sub>B</sub>. (No sign problem in this regime!) [de Forcrand, Philipsen (2002)], [D'Elia and Lombardo, (2002)]
- Recently new methods of resummation have appeared
  - \* [Mondal et.al arXiv:2106.03165],
  - \* [Gokce Basar arXiv:2105.08080],
  - \* [Karthein, et.al Eur. Phys. J. Plus 136, 621 (2021)]
  - \* [Attila Pásztor et.al Phys. Rev. D 103, 034511] (also based on Padé similar approach but different goal)

Our approach can be thought of as a combination of the Taylor expansion and analytic continuation methods.

#### The motivation

▶ In the Taylor expansion approach at  $\mu_B = 0$  we have to *live* with low order cumulants.

Also, when sampling at imaginary µ, it gets harder to extract the signal when sampling higher cumulants, the result of which is that we have information of low order Taylor series but at multiple points on the Im[µ<sub>B</sub>] axis.

The idea is to use these Tayor coefficients to build a (rational) Padé approximant.

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#### The motivation

- It is no surprise that for some classes of functions given the same information - a rational function approximates better than a polynomial. This can be seen very easily for functions with poles, branch cuts etc.
- But an even more important motivation is the recovery of singularities of a function using rational functions.

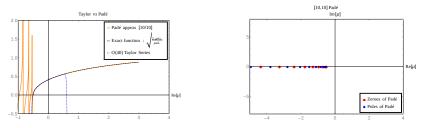


Figure: Failure of Taylor series for a function with a branch cut.

Can we do better? : Multi-Point Padé approximants

The traditional single point Padé usually requires many Taylor coefficients even to get a small order rational function!

$$f(x) = \sum_{i=0}^{L} c_i x^i + \mathcal{O}(x^{L+1}) \approx R_n^m(x) = \frac{P(x)}{1 + Q(x)} = \frac{\sum_{i=0}^{M} a_i x^i}{1 + \sum_{j=1}^{n} b_j x^j}$$

- Multiple (even low order!) Taylor expansions give us a multi-point Padé approximant!
  - \* Linear solver (approximation through order type) (Parma)

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- \* Generalised  $\chi^2$  ( Parma)
- \* Remez algorithm (Bielefeld)

#### Some examples of success :

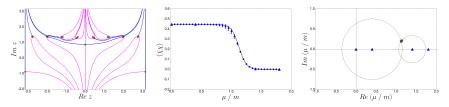


Figure: Thirring (0+1D)[F.dR.,K.Z.,S.S.,Phys.Rev.D 103 (2021) 3, 034513]

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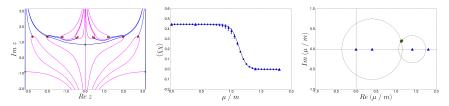
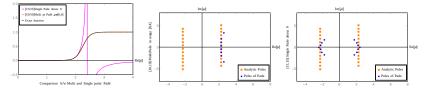


Figure: Thirring (0+1D)[F.dR.,K.Z.,S.S.,Phys.Rev.D 103 (2021) 3, 034513]



**Figure:** Left: multi-point vs single Padé approximating the function. (Middle) : Reconstruction of the analytic poles by the multi-point Padé and Bottom (Right) : and by the single point Padé

Observations on multi-point Padé (MP) based on numerical experiments

- Poles and other singularities obtained from an MP is interval sensitive<sup>2</sup>. This means that, even though the closest singularity is usually observed with this approach - we maybe more (or less) sensitive to certain zeroes or poles depending on where we sample the Taylor coefficients.
- Padé theory dictates that a genuine pole of the function will remain stable when changing order of the Padé. While this is true for clean data (functions without noise) the picture changes when we introduce noise. [Essentials of Padé approximants - G.A Baker]
- In the presence of noise we are still sensitive to the closest singularity w.r.t. the axis we expand about. The only catch being that now the pole moves about roughly in an elipse the size of the magnitude of error introduced.

 $<sup>^2 {\</sup>rm plots}$  of test functions in backup slides

# A small note on spurious poles...

It is not uncommon in Padé approximations to encounter spurious poles - even when approximating clean data - but these are not all that harmful! They come in mainly the following three forms :

- \* Exactly cancelling pairs of zeroes and poles of the rational function so no need to worry!
- \* **Isolated poles which move about wildly** while changing order - usually move away to infinity when increasing order (eg If simulate an analytic function)
- \* Simulating noisy data on the other hand can lead to a zero-pole structure in which *the genuine pole is quasi-stable and moreover the "exactly-cancelling" zero-pole pairs don't exactly cancel anymore!* The separation between them is of the order of the magnitude of error introduced!

# 2+1 flav LQCD with imaginary $\mu$

- The idea is to take 2+1 QCD at imaginary chemical potential, to see if we can gain information about its singularity structure in the complex μ<sub>B</sub> plane.
- ► The partition function gets a *non-trivial periodicity* (*Roberge-Weiss symmetry*):  $Z(\mu_B + i2\pi T) = Z(\mu_B)$
- ▶ The partition also has an additional charge conjugation symmetry under :  $\mu_B \rightarrow -\mu_B$
- At μ<sub>B</sub> = iπT there is an expectation of a first order phase transition at all temperatures above the Roberge-Weiss critical end point T<sub>RW</sub>. [A. Roberge and N. Weiss, Nuc. Phys B275 (1986) 734]

# 2+1 flav LQCD with imaginary $\mu$

Since the (imaginary) baryon density is expected to become discontinuos above *T* > *T<sub>RW</sub>* [Borsanyi et al, J. High Energ. Phys. 2018, 205 (2018)], the physical observable we are interested to study is the baryon number density µ̂<sub>B</sub> = µ<sub>B</sub>/*T*:

$$\chi_B^1(T,\hat{\mu}_B) = \frac{n_B(T,\hat{\mu}_B)}{T^3} = \frac{\partial(p(T,\hat{\mu}_B)/T^4)}{\partial\hat{\mu}_B}$$

▶ Because of the symmetries of the partition function mentioned above -  $\chi_B^1(T, \hat{\mu}_B)$  is an *odd, periodic function of*  $\mu_B/T$  when continued to imaginary chemical potential.

# 2+1 flav LQCD with imaginary $\mu$

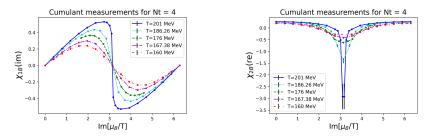
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- ▶ Because of the symmetries of the partition function mentioned above  $\chi_B^1(T, \hat{\mu}_B)$  is an *odd, periodic function of*  $\mu_B/T$  when continued to imaginary chemical potential.
- ► Taylor expansions were obtained upto  $O((\mu_B/T)^4)$  at various  $\mu_B$  values shown below.Also, HISQ action was used with  $m_s/m_l = 27$  and  $\frac{\mu_B}{3} = \mu_\ell = \mu_s$  and  $T_{RW} = 201$  MeV <sup>3</sup>

### Our Lattice setup

$N_{\sigma}^3  imes N_{ au}$	T [MeV <sup>4</sup> ]				
$24^3  imes 4$	160	167.38	176	186.26	201
num confs	5550	6000 (12K)	$\sim 2500$	2500	5000 (11K)
$36^3 \times 6$	125	145			
num confs	5280	8000			



**Figure:** Left :  $\chi_{1B}$  and Right :  $\chi_{2B}$  for N<sub> $\tau$ </sub>=4 plotted as functions of  $\mu$  and T

<sup>&</sup>lt;sup>4</sup>A.Bazavov, T.Bhattacharya, M.Cheng, C.DeTar, H.T.Ding, S.Gottlieb, R.Gupta, P.Hegde, U.M.Heller and F.Karsch, et al. Phys. Rev. D 85 (2012), 054503 doi:10.1103/PhysRevD:85.054503 < ≧ → < ≧ → < ≧ → < ?< < 1

# Higher order cumulants for N $_{\tau}$ =4

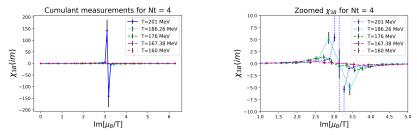
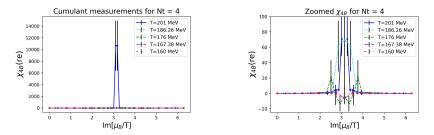
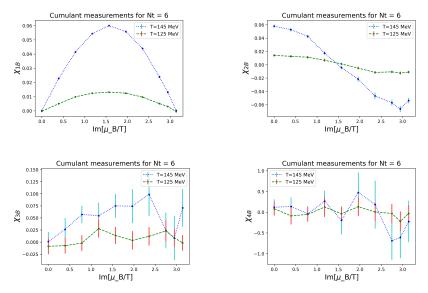


Figure: Left :  $\chi_{3B}$  and Right : Zoomed  $\chi_{3B}$  for N $_{\tau}$ =4 plotted as functions of  $\mu$  and T



**Figure:** Left :  $\chi_{4B}$  and Right : Zoomed  $\chi_{4B}$  for N<sub> $\tau$ </sub> =4 plotted as functions of  $\mu$  and T

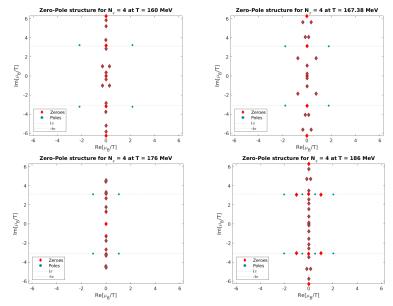
#### Cumulant measurments for N $_{\tau}$ =6, N $_{\sigma}$ =36



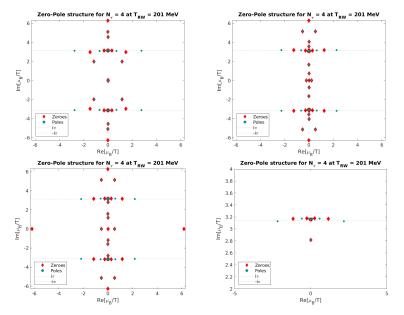
**Figure:**  $N_{\tau} = 6$  cumulants - better statistics needed!

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### Singularity structure for RW point N $_{\tau}$ =4

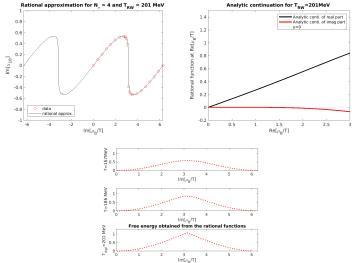


**Figure:** Zero-Pole structure from Multi-point Padé in the interval  $\mu \in [0, 2\pi i]_{\mathcal{O} \subseteq \mathbb{C}}$ 



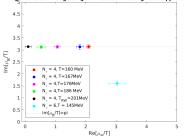
**Figure:** Zero-Pole structure for  $T_{RW}$  from Multi-point Padé in the interval  $\mu \in [0, 2\pi \iota]$  for varying choices of points

# How the approximations look like for $N_{\tau}$ =4 to extract errorbars



**Figure:** Approximations for N<sub> $\tau$ </sub> =4.TOP (L) : Rational approx. to Imag baryon number density, TOP (R) : the corresponding analytic continuation at Re[ $\mu_B/T$ ], BOTTOM : Free energy profile from the integration of rational functions at 3 temperatures.

# Bootstrapping the poles with Gaussian noise for $N_{ au} = 4$ data



signature of LY edge singularities found using Padé approach

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# Bootstrapping the poles with Gaussian noise for $N_{ au} = 4$ data

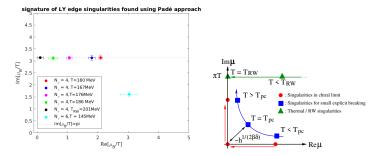


Figure: LEFT : Results from our approach , RIGHT : Complex Singularities [Gábor András Almási et.al Phys. Rev. D 100, 016016 – Published 29 July 2019]

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# Conclusions and Outlook

- We saw the power of Padé approximants to recognize singularities - and also differentiate between the types of singularities. Moreover, if we are stuck in a scenario with less Taylor coefficients but at multiple points in an interval, a Multi-Padé provides a good approximation for the function and also a good estimate of the singularities in that interval.
- In studying QCD at imaginary chemical potential, we seem to find the signature of the RW singularity using ("stable")poles of the Padé approximant. Other singularities (T<sub>pc</sub>) need further investigation. More on the scaling of these poles in the next talk by G. Nicotra.
- The runs (generation and measurements codes) were performed between Marconi100 (Cineca Bologna, ISCRA C project and INFN computing time) by K.Zambello in Parma and Jülich Supercomputing Centre (JSC) (Germany) by the Bielefeld group.

# BACK-UP SLIDES!!

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# Interval dependence of multi-point Padé

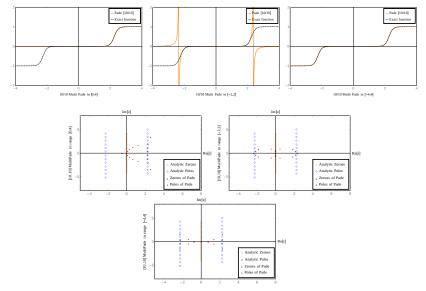
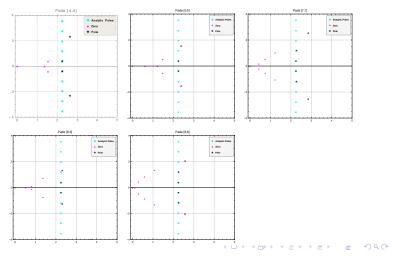


Figure: Depending on what interval we sample points and their Taylor coeffs - we are more (less) sensitive to certain zeroes or poles

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#### Thirring without errors

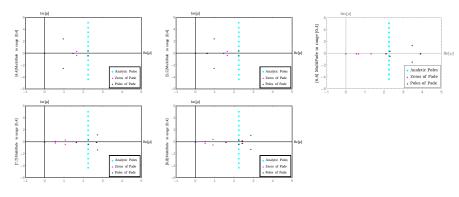
The reconstruction of the line of singularities present in the 1D Thirring model as we increase the order of the approximation. It can be seen that with increasing order the Padé reconstructs more singularities progressively.



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#### Thirring with errors

Performing the exercise above with identical sets of points but now with data that has 1% error on values and 10% error on the first derivatives we get the following picture. It seems that the Padé is able to reconstruct only the closest singularities faithfully. (This is in agreement wit George Bakers book.)



#### So how bad is the situation?



Figure: Sensitivity to the closest pole even in the presence of errors! Left : 1% noise on values and 10% noise on 1st der and Right : 5% noise on values and 15% noise on 1st der for [4/4] Padé



Figure: Sensitivity to the closest pole even in the presence of errors! Left : 1% noise on values and 10% noise on 1st der and Right : 5% noise on values and 15% noise on 1st der for [6/6] Padé